

# Sharing a Sequential Program: Correctness and Concurrency Analysis

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## Abstract

It seems to be generally accepted that designing correct and efficient concurrent software is a sophisticated task that can only be held by experts. A crucial challenge then is to convert sequential code produced by a “mainstream” programmer into concurrent one. Various synchronization techniques may be used for this, e.g., locks or transactional memory, but what does it mean for the resulting concurrent implementation to be correct? And which synchronization primitives provide more efficiency at the end?

In this paper, we introduce a correctness criterion for a concurrent “wrapper” of a sequential program, i.e., a transformation that enables the use of a sequential data structure in a concurrent system. Informally, we require the resulting concurrent implementation to be *locally sequential*: concurrent threads simply run the given sequential code and let the implementation worry about the potential conflicts. To make sense globally, the implementation should also be *linearizable* with respect to the *object type* of the data structure.

We then evaluate the performance of different concurrent implementations in terms of the sets of *schedules* (interleavings of steps of the sequential code) they *accept*. Intuitively, this captures the amount of concurrency that a given implementation can stand. This allowed us to analyze relative power of seemingly incomparable synchronization techniques, such as various forms of locking and transactional memory.

## 1 Introduction

Implementing a correct and efficient data structure shared by multiple users is believed to be a tedious and error-prone process. What if, instead, we use a concurrent “wrapper” of a *sequential* implementation of the data structure that allows every user to *locally* run its sequential code so that the resulting concurrent execution is *globally* correct.

One way to do this is to use *locks* so that critical parts of a sequential program are only accessed in an exclusive mode. An implementation that grabs a lock on the whole data structure before executing a sequential operation imposes a serial order of operations but neglects the benefits provided by the multiprocessing power of modern machines. Efficient fine-grained locking requires

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lots of intelligence, since it must be based on good understanding of which parts of the sequential code to protect at what time.

A more automated approach is to use transactional memory (TM) and treat each (sequential) operation as a speculative *transaction*. If the transaction commits, the corresponding operation returns the response computed based on the state the transaction witnessed. If the transaction aborts, the operation does not take effect. This approach promises to make use of the hardware concurrency at low intellectual cost. But does this simplicity bring an efficiency degradation?

**Local serializability and LS-linearizability.** We start with defining the very meaning of using a sequential data structure in a concurrent environment. One natural correctness requirement is that no thread ever reaches a state not anticipated by the sequential implementation. More precisely, we model an execution of a concurrent implementation as a sequence of invocations and responses of the *high-level* operations on the data structure (e.g., *Insert*, *Remove*, or *Contains* calls on a *set* object), events of the corresponding sequential implementation (e.g., reads and writes to the items of a sorted linked-list used to implement a set), plus accesses to synchronization primitives (e.g., transaction delimiters or acquisitions and releases of locks). Now we say that an execution is *locally serializable* if the sequence of sequential events corresponding to each high-level operation is consistent with *some* sequential execution. The condition is weaker than *serializability* [19] since it allows sequential executions corresponding to different high-level operations to be mutually inconsistent. In particular, there may not exist a single sequential execution on the given data structure that is consistent with all local executions. But it is good enough as long as we only want our concurrent data structure to locally appear sequential.

On the other hand, the implementation should “make sense” globally, given the *type* of our data structure. We require that the *high-level* history of every execution, i.e., the subsequence of high-level invocations and responses, is *linearizable* [3, 15]: each high-level operation should appear instantaneous at some point within its interval so that the high-level sequential semantics is respected.

The combination of local serializability and linearizability gives a correctness criterion which we call *LS-linearizability*, where LS stands for “locally serializable.” Note that we can easily think of implementations that are linearizable but not LS-linearizable (do not look sequential locally), as well as locally serializable but not linearizable (do not make sense globally). Therefore, the two properties indeed complement each other. We also show that LS-linearizability inherits one important property of linearizability [14, 15]: it is *compositional*, a composition of LS-linearizable implementations is also LS-linearizable.

For example, consider the *set* type implemented sequentially using a sorted linked list (cf. Algorithm 1 in Appendix A). To check if the set contains a given value in a concurrent execution, we do not need to take a snapshot of the linked-list content. It is enough to make sure that each *two* consecutive elements of the list are read atomically. Indeed, the resulting LS-linearizable concurrent *set* implementation (described in detail in Appendix B) only requires an operation to hold locks on two consecutive list elements at a time (so called *hand-over-hand* locking [4, 14]). As a result, the *Contains()* operation may run concurrently with multiple *Insert()* operations, as long as they do not contend on the same consecutive pair of list elements.

**Relative concurrency.** The sorted linked-list example above suggests that we can evaluate the performance of an implementation via the “amount of concurrency” it allows for. More precisely, we can associate the implementation with the set of *schedules* (interleavings of steps of the sequential operations invoked by multiple users) it *accepts*, i.e., is able to process. Now we can

compare different concurrent implementations (or implementation classes) for a given sequential data structure (or a class of data structures) based on the sets of accepted schedules. It is particularly intriguing to compare the concurrency properties provided by various classes of TMs against locking techniques. Indeed, a TM interacts with its user application through a fixed transactional interface (*reads*, *writes*, *tryCommit* or *tryAbort*), and have no clue about the object’s semantics, unlike lock-based implementations. On the other hand, TMs may “undo” their operations by aborting the corresponding transactions, which cannot be achieved with locks. The conditions under which a TM may (or have to) abort a transaction (e.g., captured via *progress* conditions [11]) are of crucial importance here, since, intuitively, they allow the TM to distinguish correct (observed in LS-linearizable histories) schedules from incorrect ones.

**Results of concurrency analysis.** We show first that fine-grained locking provides strictly more concurrency than a wide class of *conflict-resolving* TM-based implementations (resolving conflicts between concurrent transactions by forcefully aborting some of them) [12]. We describe a lock-based implementation that accepts every schedule with no conflicts, i.e., locking provides *at least as much* concurrency as conflict-resolving TMs. Moreover, we present a schedule that cannot be accepted by *any* strictly serializable TM (be it conflict-resolving or not), yet the schedule is accepted by a linked-list implementation using hand-over-hand locking [4, 14]. As a corollary, we derive that locking provides *strictly* more concurrency than *conflict-resolving* TMs. This is the price to pay for TMs being “oblivious” to the semantics of the object they implement, combined with the brute-force approach to conflict resolution.

However, we show that the price is not inherent for TM implementations that enforce stronger progress conditions. The use of multi-version concurrency control allows implementing *MV-permissive* [20] strictly serializable TMs in which *read-only* transactions always commit. Surprisingly, TM implementations in this class accept schedules which cannot be accepted by *any* lock-based implementation. Nevertheless, as handling multiple versions is known to come at a significant cost [20], it is hard to translate such concurrency improvements to performance gains. In response to this, we extend our result to *single-version* strictly serializable TMs that abort read-only transactions only if they witnesses two or more concurrent updates. We conjecture further that TMs with *relaxed* consistency guarantees, such as elastic transactions [5, 9], may be used to match the performance of locks for a large class of search data structures (queues, hash tables or trees).

At a large scale, we cannot definitively say that locks supersede transactions or vice versa. To determine the amount of concurrency provided by a synchronization technique, one should carefully specify its correctness and progress conditions, as well as on the type and sequential implementations of the given data structure. This paper gives a language in which relative concurrency of seemingly incomparable synchronization techniques can be properly analyzed.

**Roadmap.** Section 2 gives basics of our system model. Section 3 introduces LS-linearizability and defines our concurrency relations. Section 4 presents a comparative concurrency analysis of lock-based implementations and TM-based ones. We conclude by discussing related work and open questions in Sections 5 and 6. Omitted proofs can be found in the optional appendix.

## 2 Model

In this section, we define what we mean by *transforming* a sequential type implementation into a concurrent one, and describe two synchronization techniques: locks and transactional memory.

**Sequential types and Implementations.** An *object type*  $\tau$  is specified by the tuple  $(\Phi, \Gamma, Q, q_0, \delta)$  where  $\Phi$  is a set of operations,  $\Gamma$  is a set of responses,  $Q$  is a set of states,  $q_0 \in Q$  is an initial state and  $\delta \subseteq Q \times \Phi \times Q \times \Gamma$  is a transition relation that determines, for each state, and each operation, the set of possible resulting states and produced responses. Hence,  $(q, \pi, q', r) \in \delta$  implies that when an operation  $\pi \in \Phi$  is applied on an object of type  $\tau$  in state  $q$ , the object moves to state  $q'$  and returns a response  $r$ . We assume that  $\delta$  is *total*, i.e., for every  $q \in Q$ ,  $\pi \in \Phi$ , there exist  $q' \in Q$  and  $r \in \Gamma$  such that  $(q, \pi, q', r) \in \delta$ . We assume that every type  $\tau = (\Phi, \Gamma, Q, q_0, \delta)$  is *computable*, i.e., there exists a Turing machine that, for each input  $(q, \pi)$ ,  $q \in Q$ ,  $\pi \in \Phi$ , computes a pair  $(q', r)$  such that  $(q, \pi, q', r) \in \delta$ . Hence, we can construct a *sequential implementation* of type  $\tau$  as follows. For each operation  $\pi$ , we define a deterministic procedure  $\mathcal{P}^\pi$  that performs *reads* and *writes* on a collection of objects  $X_1, \dots, X_m$ ,  $m \in \mathbb{N}$ . The value returned by  $\mathcal{P}^\pi$  is treated the response to  $\pi$  returned by the implemented object.

**Concurrent implementations.** We focus on the problem of turning a given sequential implementation  $I_S$  of type  $\tau$  into a *concurrent* one, shared by  $n$  *processes* (users)  $p_1, \dots, p_n$  ( $n \in \mathbb{N}$ ). Each sequential procedure  $\mathcal{P}^\pi$  is converted into a concurrent one by inserting synchronization constructs (such as locks or delimiters of software transactions) between reads and writes performed by  $\mathcal{P}^\pi$ . Intuitively, the resulting concurrent implementation must locally (to each particular operation) look like the sequential implementation  $I_S$ , while being globally correct with respect to  $\tau$  (a precise definition of our correctness criterion is given in Section 3).

**Executions.** An *execution* of a concurrent implementation is thus a sequence of invocations and responses of high-level operations, (atomic) read and write events and *synchronization* events (e.g., lock acquisitions and releases or transaction delimiters). We assume that executions are *well-formed*: no process invokes a new high-level operation before the previous one returns or takes steps outside its operation's interval. In this paper, we primarily focus on two synchronization techniques: locks and transactional memory (TM), described in detail below.

**Exported histories.** Informally, a *history exported by an execution*  $E$  is the sequence of invocations and responses of high-level operations and read-write events that *take effect* in  $E$ . The exact definition depends on the type of synchronization primitives used in the execution, and should be defined separately in each case (we define it for locks and TMs below). By convention, every execution of a sequential implementation  $I_S$  is already a history. Histories  $H$  and  $H'$  are *equivalent* if, for every process  $p_i$ ,  $H|_{p_i} = H'|_{p_i}$ .

A *high-level history*  $\tilde{H}$  of an execution  $E$  is the sequence of invocations and responses on high-level objects in  $E$ . A high-level operation  $\pi$  *precedes* another high-level operation  $\pi'$  in  $\tilde{H}$ , denoted  $\pi \rightarrow_{\tilde{H}} \pi'$ , if the response of  $\pi$  occurs before the invocation of  $\pi'$ . Two high-level operations are *concurrent* if neither precedes the other. A high-level history is *sequential* if it has no concurrent operations.  $\tilde{H}$  is *complete* if every invocation has a corresponding response. A history  $H$  is *complete* if the corresponding high-level history  $\tilde{H}$  is complete.

A complete high-level history  $\tilde{H}$  is *linearizable* with respect to an object type  $\tau$  if it is possible to permute events in  $\tilde{H}$  to obtain a sequential high-level history  $S$  such that (1)  $\rightarrow_{\tilde{H}} \subseteq \rightarrow_S$  and (2)  $S$  is consistent with type  $\tau$ . Now an arbitrary history  $\tilde{H}$  is linearizable if it can be *completed* (by adding matching responses to a subset of incomplete operations in  $\tilde{H}$  and removing the rest) to a linearizable high-level history [3, 15].

**Locks.** A *lock* provides exclusive access to an object  $X$  and is accessed through atomic operations  $acquire^S(X)$  (*shared mode*),  $acquire^E(X)$  (*exclusive mode*) and  $release(X)$ . If no process holds the

lock on some object  $X$  in shared or exclusive mode, then  $acquire^E(X)$  returns *true*; if no process holds the lock on some object  $X$  in exclusive mode, then  $acquire^S(X)$  returns *true*.

Given a sequential data structure, a corresponding concurrent lock-based one is obtained by inserting *acquire* and *release* events between the read-write events of each sequential operation. We assume a *dynamic* locking scheme: a process may only acquire a lock on  $X$  if  $X$  is the next object it is going to access. Also, a process releases all locks it acquired before returning the result of the operation. The history exported by an execution  $E$  of a lock-based implementation is the sequence of events obtained from  $E$  by removing all synchronization (acquire/release) events.

**Transactional memory.** A transactional memory (*TM*) provides access to a collection of shared objects (*t-objects*) via *atomic transactions*. A transaction  $T_k$  is a sequence of *reads* and *writes* on t-objects that begins with *start-txn* and ends with *tryCommit* or *tryAbort*, where *tryCommit* returns either *commit* (the transaction takes effect) or *abort* (the transaction does not take effect), and *tryAbort* aborts the transaction. Each transaction  $T_k$  and all its events are associated with a unique identifier  $k$ . Transactions  $T_i, T_j$  *conflict* in an execution  $E$  on a t-object  $X$  if there exists a prefix of  $E$  in which  $T_i$  and  $T_j$  are incomplete and access  $X$ , and at least one of these accesses is a *write*. A transaction  $T_k$  is *t-complete* in  $E$  if it ends with *tryCommit* or *tryAbort*. We say that  $E$  is *t-complete* if it contains only t-complete transactions. For  $T_k, T_m$  in  $E$ , we say that  $T_k$  *precedes*  $T_m$  in the *real-time order* in  $E$ , if  $T_k$  is committed or aborted and the last event of  $T_k$  precedes the first event of  $T_m$  in  $E$ . Two transactions are *concurrent* if neither precedes the other.  $E$  is *t-sequential* if no two transactions are concurrent in  $E$ . We say that a t-complete t-sequential history  $E$  is *legal* if for every t-object  $X$ , every read of  $X$  in  $E$  returns the latest written value of  $X$ . Let  $\bar{E}$  denotes the subsequence of  $E$  consisting of the events of committed transactions. A t-complete execution  $E$  is *strictly serializable* if there exists a legal complete t-sequential history  $S$  such that (1)  $\bar{E}$  and  $S$  are equivalent and (2)  $S$  respects the real-time order of transactions. Now we say that a TM-based execution is strictly serializable if we can extend it to produce a t-complete strictly serializable execution. A TM implementation  $M$  is strictly serializable if every execution of  $M$  is strictly serializable.

Note that we make a simplifying assumption that all TM operations appear atomic, which applies to most existing TMs. In terms of liveness, we assume that these operations are starvation-free: as long as every process is correct, every tm-operation eventually returns. In this paper, we primarily focus on *strictly serializable* TMs (formal definition in Appendix C).

Given a sequential data structure, a corresponding TM-based concurrent one puts each sequential operation within a transaction, i.e., every operation  $\pi$  on it is implemented as: *start-txn*;  $\mathcal{P}^\pi$ ; *tryCommit*, where  $\mathcal{P}^\pi$  is the sequential implementation of  $\pi$ . If *tryCommit* returns *commit*, then the result of  $\mathcal{P}^\pi$  is returned to the user. The history exported by an execution  $E$  of a TM-based implementation is the subsequence of  $E$  obtained by removing all synchronization events and all events related to *aborted* or *incomplete* transactions.

### 3 LS-linearizability

Let  $H$  be a history, and let  $\pi$  be a high-level operation in  $H$ . Then  $H|\pi$  denotes the subsequence of  $H$  consisting of the events of  $\pi$ . Let  $I_S$  be a sequential implementation of an object of type  $\tau$ .

**Definition 1** A history  $H$  is locally serializable with respect to  $I_S$  if for all high-level operations  $\pi$  in  $H$ , there exists  $S \in \Sigma$ , where  $\Sigma$  is the set of histories of  $I_S$ , such that  $H|\pi = S|\pi$ .

Note that local serializability stipulates that the execution is witnessed sequential by every high-level operation in isolation. Two different operations (even when invoked by the same process) are not required to witness mutually consistent sequential executions.

**Definition 2** A history  $H$  is LS-linearizable with respect to  $(I_S, \tau)$  if (1)  $H$  is locally serializable with respect to  $I_S$ , and (2) the corresponding high-level history  $\tilde{H}$  is linearizable with respect to  $\tau$ .

A correctness property is *compositional* [14, 15] if, informally, a composition of correct object implementations is also correct. LS-linearizability is compositional (Appendix ??). It is not *non-blocking* [14, 15], however, in the sense that an incomplete operation may not be able to complete on its own, which may be seen as a feature inherent to local serializability.

We define the composition of two distinct object types  $\tau_1$  and  $\tau_2$  as a type  $\tau_1 \times \tau_2 = (\Phi, \Gamma, Q, q_0, \delta)$  as follows:  $\Phi = \Phi_1 \cup \Phi_2$ ,  $\Gamma = \Gamma_1 \cup \Gamma_2$ ,<sup>1</sup>  $Q = Q_1 \times Q_2$ ,  $q_0 = (q_{01}, q_{02})$ , and  $\delta \subseteq Q \times \Phi \times Q \times \Gamma$  is such that  $((q_1, q_2), \pi, (q'_1, q'_2), r) \in \delta$  if and only if  $\pi \in \Phi_i$  ( $i = 1, 2$ ) and  $(q_i, \pi, q'_i, r) \in \delta_i$ .

Every sequential implementation  $I_S$  of an object  $O_1 \times O_2$  of a composed type  $\tau_1 \times \tau_2$  naturally induces two sequential implementations  $I_{S1}$  and  $I_{S2}$  of objects  $O_1$  and  $O_2$ , respectively. Now a correctness criterion  $\Psi$  is *compositional* if for every history  $H$  on an object composition  $O_1 \times O_2$ , if  $\Psi$  holds for  $H|O_i$  with respect to  $I_{Si}$ , for  $i = 1, 2$ , then  $\Psi$  holds for  $H$  with respect to  $I_S = I_{S1} \times I_{S2}$ . Here,  $H|O_i$  denotes the subsequence of  $H$  consisting of steps on  $O_i$ .

**Theorem 3** LS-linearizability is compositional.

**Proof.** Let  $H$ , a history on  $O_1 \times O_2$ , be LS-linearizable with respect to  $I_S$ . Let each  $H|O_i$ ,  $i \in \{1, 2\}$ , be LS-linearizable with respect to  $I_{Si}$ . Without loss of generality, we assume that  $H$  is complete (if  $H$  is incomplete, we consider any completion of it containing LS-linearizable completions of  $H|O_1$  and  $H|O_2$ ).

Let  $\tilde{H}$  be the history of  $H$ . By the assumption,  $\tilde{H}|O_1$  and  $\tilde{H}|O_2$  are linearizable with respect to  $\tau_1$  and  $\tau_2$ , respectively. Since linearizability is compositional [14, 15],  $\tilde{H}$  is linearizable with respect to  $\tau_1 \times \tau_2$ .

Now let, for each operation  $\pi$ ,  $S_\pi^1$  and  $S_\pi^2$  be any two sequential histories of  $I_{S1}$  and  $I_{S2}$  such that  $H|\pi|O_j = S_\pi^j|\pi$ , for  $j = 1, 2$  (since  $H|O_1$  and  $H|O_2$  are LS-linearizable such histories exist). We construct a sequential history  $S_\pi$  by interleaving events of  $S_\pi^1$  and  $S_\pi^2$  so that  $S_\pi|O_j = S_\pi^j$ ,  $j \in \{1, 2\}$ . Since each  $S_\pi^j$  acts on a distinct component  $O_j$  of  $O_1 \times O_2$ , every such  $S_\pi$  is a sequential history of  $I_S$ . We pick one  $S_\pi$  that respect the local history  $H|\pi$ , which is possible, since  $H|\pi$  is consistent with both  $S_1|\pi$  and  $S_2|\pi$ .

Thus, for each  $\pi$ , we obtain a history of  $I_S$  that agrees with  $H|\pi$ . Moreover, the high-level history of  $H$  is linearizable. Thus,  $H$  is LS-linearizable.  $\square$

It is easy to see that LS (locally serializable) linearizability is distinct from both serializability [19] and linearizability [15]. For example, the classical queue implementation by Michael and Scott [17] is linearizable, but allows threads to witness states that can only arise in concurrent executions (e.g., when underlying CAS operations fail).

Also, consider the history of a sorted linked-list implementation depicted in Figure 2. Here we assume that the initial state of the set is  $\{1, 3, 4, 5\}$ , object  $X_i$  ( $i = 1, \dots, 6$ ) is used for storing value  $i$ , and operation *Contains()* returns *true*. The high-level history is linearizable with respect to the

<sup>1</sup>Here we treat each  $\tau_i$  as a distinct type by adding index  $i$  to all elements of  $\Phi_i$ ,  $\Gamma_i$ , and  $Q_i$ .

Integer Set type (*Contains()* is linearized after the two *Insert()* operations). But since *Contains()* observes an old value of  $X_1$  (present before *Insert(2)*) and a new value of  $X_5$  (written by *Insert(6)*), and *Insert(6)* reads the value of  $X_1$  written by *Insert(2)*, there is no way to find a global serialization for the three operations, i.e., the history is not serializable. But, as we show in Section 4, there exists an LS-linearizable Integer Set implementation based on hand-over-hand locking that exports this history.

**Preliminary observations.** *Two-phase locking (2PL)* [23] is a lock-based implementation technique in which every *read* of an object in the course of an operation involves acquiring a *shared* lock and every *write* involves acquiring an *exclusive* lock, and all acquired locks are released before returning the result of the operation. Thus, every sequential procedure of a sequential implementation  $I_S$  is converted into a concurrent one by inserting  $acquire^S(X)$  before  $read(X)$  and  $acquire^E(X)$  before  $write(X)$ . The corresponding *release* events are inserted at the end of the procedure. Let  $I_S^{2PL}$  denote a concurrent implementation of a sequential data structure  $I_S$  based on 2PL. Since 2PL guarantees strict serializability [23], we immediately obtain:

**Observation 4** *For any sequential implementation  $I_S$  of a type  $\tau$ ,  $I_S^{2PL}$  is LS-linearizable with respect to  $(I_S, \tau)$ .*

Similarly, if we transform a sequential implementation  $I_S$  of type  $\tau$  into a concurrent one using  $\mathcal{M}$ , by treating every operation of  $I$  as a transaction, we obtain a strictly serializable and linearizable implementation  $I_S^{\mathcal{M}}$ , which implies:

**Observation 5** *For any strictly serializable TM implementation  $\mathcal{M}$ , and any sequential implementation  $I_S$  of a type  $\tau$ ,  $I_S^{\mathcal{M}}$  is LS-linearizable with respect to  $(I_S, \tau)$ .*

Consider the sequential implementation  $LL$  of the Integer Set type (or *set* for brevity) described in Algorithm 1 in Appendix A. The type *set* maintains operations *Insert*, *Remove* and *Contains* with the usual semantics. We describe a concurrent implementation,  $I^{HOH}$ , derived from  $LL$  based on *hand-over-hand* locking [4] (*HOH*) (Algorithm 2 in Appendix B).

**Theorem 6**  *$I^{HOH}$  is LS-linearizable with respect to  $(LL, set)$ .*

### 3.1 Concurrency relations

A *schedule* is an equivalence class of histories that agree on the order of events but possibly not on read values or high-level responses. Intuitively, a schedule describes the order in which high-level operations, and sequential reads and writes are invoked by the user. We say that an implementation  $I$  *accepts* a schedule  $S$  if there exists an execution of  $I$  which exports a history exhibiting the order of  $S$ . Given a concurrent implementation  $I$ , let  $\mathcal{S}(I)$  denote the set of schedules accepted by  $I$ . Intuitively,  $\mathcal{S}(I)$  reflects the “amount of concurrency” provided by  $I$ .

A *synchronization technique* is a set of concurrent implementations. Given a sequential implementation  $I_S$  of an object type  $\tau$  and a synchronization technique  $\mathcal{A}$ , let  $\mathcal{T}_{\mathcal{A}}(I, \tau)$  denote the set of LS-linearizable (with respect to  $(I_S, \tau)$ ) implementations in  $\mathcal{A}$ . We say that a synchronization technique  $\mathcal{A}$  provides *less concurrency* than a synchronization technique  $\mathcal{B}$  with respect to  $(I_S, \tau)$ , and we write  $\mathcal{A} \preceq_{(I_S, \tau)} \mathcal{B}$ , iff  $\forall I \in \mathcal{T}_{\mathcal{A}}(I_S, \tau), \exists I' \in \mathcal{T}_{\mathcal{B}}(I_S, \tau), \mathcal{S}(I) \subseteq \mathcal{S}(I')$ .

We say that  $\mathcal{A}$  provides *strictly less concurrency* than  $\mathcal{B}$  with respect to  $(I_S, \tau)$ , and we write  $\mathcal{A} \prec_{(I_S, \tau)} \mathcal{B}$ , iff  $(\mathcal{A} \preceq_{(I_S, \tau)} \mathcal{B}) \wedge (\mathcal{B} \not\preceq_{(I_S, \tau)} \mathcal{A})$ .

If  $\mathcal{A} \preceq_{(I_S, \tau)} \mathcal{B}$  for all  $(I_S, \tau)$ , then we say that  $\mathcal{A}$  provides *less concurrency* than  $\mathcal{B}$  and write  $\mathcal{A} \preceq \mathcal{B}$ . Similarly, we write  $\mathcal{A} \prec \mathcal{B}$ , iff  $(\mathcal{A} \preceq \mathcal{B}) \wedge (\mathcal{B} \not\preceq \mathcal{A})$ .

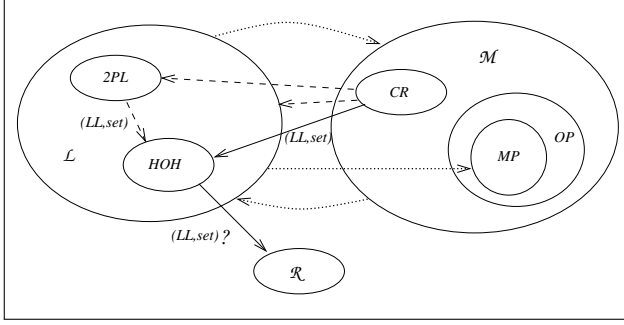


Figure 1: Summary of comparative analysis of synchronization techniques

$\mathcal{L}$	dynamic fine-grained locking
$2PL$	two-phase locking
$HOH$	hand-over-hand locking
$\mathcal{M}$	strictly-serializable TMs
$CR$	conflict-resolving TMs
$MP$	MV-permissive TMs
$OP$	1-progressive TMs
$\mathcal{R}$	relaxed TM (conjectured)
$--->$	$\preceq$
$\longrightarrow$	$\prec$
$\cdots >$	$\not\prec$
$(LL, set)$	with respect to $(LL, set)$

Table 1: Notations

## 4 Locks vs. Transactional memory: Concurrency Analysis

In this section, we use our concurrency relations to compare two synchronization techniques: locking (denoted  $\mathcal{L}$ ) and strictly serializable transactional memory (denoted  $\mathcal{M}$ ). We also consider three subclasses of  $\mathcal{M}$ : *conflict-resolving* implementations ( $CR$ ), *MV-permissive* implementations ( $MP$ ) and *1-progressive* implementations ( $OP$ ), and two subclasses of  $\mathcal{L}$ : *two-phase locking* ( $2PL$ ) and *hand-over-hand locking* ( $HOH$ ). A summary of our results is presented in Figure 1.

### 4.1 Conflict-resolving TMs

We say that an TM implementation is *conflict-resolving* if it exports no history in which two committed transactions experience a *conflict*. Intuitively, in conflict-resolving TMs, such as [12], a transaction that witnesses a read-write conflict at some point during its execution is forcefully aborted or delayed. The class of implementations based on conflict-resolving TMs is denoted by  $CR$ .  $2PL$  ensures that

**Theorem 7**  $CR \preceq 2PL$ .

**Proof sketch.** Let  $I \in CR$ . Let schedule  $S$  be accepted by  $I$ , and let  $H$  be the corresponding history be exported by  $I$ . Recall that  $H$  only contains events from committed transactions. Suppose, by contradiction, that  $S$  is not accepted by  $I^{2PL}$ , i.e., some  $acquire^S$  or  $acquire^E$  invoked in  $H$  is unsuccessful. But then  $H$  has a prefix in which two high-level operations  $\pi$  and  $\pi'$  (1) are *not complete* and (2) both access the same object and at least one of these accesses is a *write*. Hence, the execution of  $I$  that exported  $H$  contains two conflicting committed transactions—a contradiction with the assumption that  $I \in CR$ . Thus,  $\mathcal{S}(I) \subseteq \mathcal{S}(2PL)$ .  $\square$

Now we show that there exist schedules that are accepted by some implementations in  $\mathcal{T}_{\mathcal{L}}(LL, set)$  (in our case  $I^{HOH}$ , the  $HOH$  implementation of a linked list-based set) but not by *any* implementation in  $\mathcal{T}_{TM}(LL, set)$ . Specifically, consider the schedule depicted in Figure 2. We observe that no two consecutive reads performed by the *Contains*(6) operation witness a conflicting write and, thus,  $I^{HOH}$  accepts the schedule. On the other hand, there is no way to serialize the three operations respecting the real-time order for *Insert*(2) and *Insert*(6) and making sure that the execution of *Contains*(6) appears sequential. Thus:

**Theorem 8**  $HOH \not\prec_{(LL, set)} \mathcal{M}$ .



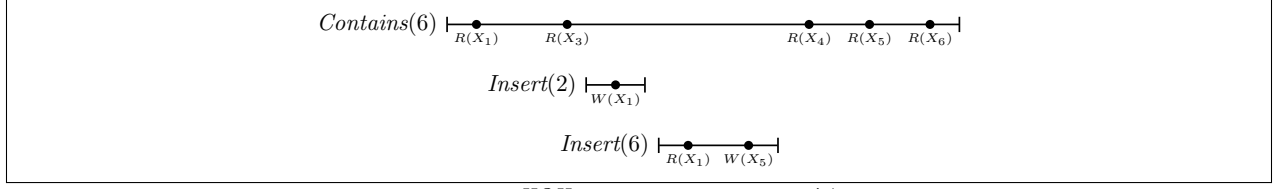


Figure 2: A schedule  $S_0$  accepted by  $I^{HOH}$  but rejected by  $I^M$  (we only show read-write events that matter); the initial state of the list is  $\{1, 3, 4, 5\}$

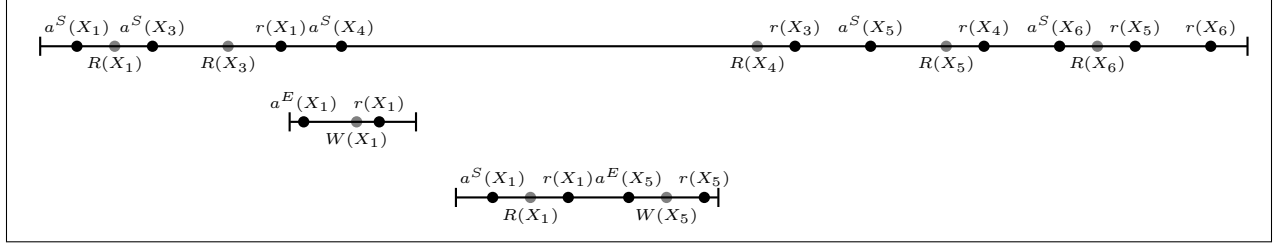


Figure 3: An execution of  $I^{HOH}$  that accepts  $S_0$ ;  $a^S$ ,  $a^E$  denote lock acquisition in shared, exclusive modes,  $r$  denotes the release event.

**Proof.** Consider processes  $p_1$ ,  $p_2$  and  $p_3$  that execute operations  $Contains(6)$ ,  $Insert(2)$  and  $Insert(6)$  respectively. We show that the schedule  $S_0$  in Figure 2 is accepted by  $I^{HOH}$ . Indeed, Figure 3 presents an execution of  $I^{HOH}$  that exports  $S_0$ . It is easy to see that the  $acquire^S$  on  $X_1$ ,  $X_3$ ,  $X_4$  is successful since there are no concurrent writes performed on these objects in this execution. It is thus enough to verify that  $p_1$  does not hold the shared lock on  $X_1$  (resp.,  $X_5$ ) at the moment  $p_2$  (resp.,  $p_3$ ) tries to acquire an exclusive lock on it. Process  $p_2$  acquires the exclusive lock on  $X_1$  to insert 2 after  $p_1$  has released the lock on  $X_1$ . Process  $p_3$  invokes  $acquire^S$  on  $X_1$ ,  $X_2$ ,  $X_3$ ,  $X_4$  and returns successfully (since  $Insert(2)$  precedes  $Insert(6)$  in real-time) and finally invokes  $acquire^E$  on  $X_5$ . Note that, at this point in the execution,  $p_1$  does not hold the shared lock on  $X_5$ . Hence, the  $acquire^E$  on  $X_5$  is successful. After the release of the lock on  $X_5$  by  $p_3$ , process  $p_1$  successfully acquires the shared lock on  $X_5$  and  $X_6$ . Since  $\{1, 3, 4, 5\}$  is the initial state of the list,  $Contains(6)$  is linearized after  $Insert(6)$  and returns *true* in  $H$ .

Suppose now that  $S_0 \in \mathcal{S}(I^M)$ , where  $M$  is a strictly serializable TM, and let  $H'$  be the corresponding history. Let transactions  $T_1$ ,  $T_2$  and  $T_3$  encapsulate  $Contains(6)$ ,  $Insert(2)$  and  $Insert(6)$ , respectively, in  $H'$ . Note that  $T_2$  must precede  $T_3$  in any serialization (real-time order). Since  $T_1$  reads  $X_1$  before  $T_2$  updates it,  $T_1$  must be serialized before  $T_2$ . Thus, to produce a legal serialization of reads and writes,  $T_1$  must read the initial value of  $X_5$ , where  $X_5.next$  points to the tail of the list (according to our sequential implementation  $I_S$ ).

But then, according to  $I_S$ ,  $Contains(6)$  cannot access  $X_6$  in  $H'$ , i.e.,  $H'$  is not locally serializable (with respect to  $Contains(6)$ )—a contradiction.  $\square$

**Corollary 9**  $\mathcal{L} \not\preceq \mathcal{M}$ .

Theorem 7 and Corollary 9 imply:

**Corollary 10**  $CR \prec \mathcal{L}$ .

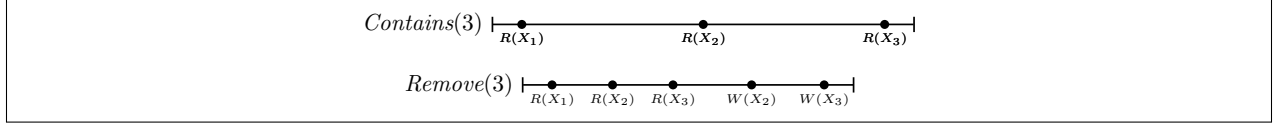


Figure 4: A schedule accepted by a *MV-permissive* TM implementation, but rejected by any lock-based implementation; the initial state of the list is  $\{1, 2, 3\}$

## 4.2 MV-permissive TMs

An *MV-permissive* [20] TM allows a transaction to abort only if it is an updating transaction that conflicts with another updating transaction (In particular, no read-only transaction can abort). We denote by *MP* the class of implementations based on MV-permissive TMs.

Consider the schedule of an implementation of  $(LL, set)$  depicted in Figure 4. It is easy to see that the schedule does not contain update-update conflicts, so an MV-permissive TM must accept the schedule (enforcing  $R(X_2)$  and  $R(X_3)$  to return the initial values). The resulting history (assuming *Contains(3)* returns *true*) is linearizable and locally serializable with respect to  $(LL, set)$ .

In contrast, for any implementation in  $\mathcal{T}_{\mathcal{L}}(LL, set)$ ,  $R(X_3)$  performed by *Contains(3)* must return the value written in  $W(X_3)$  performed by *Remove(3)* (otherwise the execution is not serializable). But  $W(X_3)$  marks  $X_3$  as removed from the list, which can never be observed in a sequential execution of *LL*. Thus, the execution of *Contains(3)* is not locally serializable.

**Theorem 11**  $MP \not\subseteq_{(LL, set)} \mathcal{L}$ .

**Proof.** Consider a implementation in  $\mathcal{T}_{\mathcal{L}}(LL, set)$  in which processes  $p_1$  and  $p_2$  execute operations *Contains(3)* and *Remove(3)*, respectively. Process  $p_2$  performs a *write* of  $X_3$  that marks the node to be removed from the list and then  $p_1$  performs the *read* of node  $X_3$  (which has been deallocated from the list). But the history exported by any such execution is incorrect. Thus, there does not exist a lock-based implementation  $I^{\mathcal{L}}$  such that  $\{S_1\} \in \mathcal{S}(I^{\mathcal{L}})$ .

Let  $I^{MP}$  denote a TM implementation that belongs to class *MP*. Let  $E_1$  denote an execution of  $I^{MP}$  in which transactions  $T_1, T_2$  encapsulate *Contains(3)* and *Remove(3)* respectively. Since  $T_1$  is read-only and  $T_2$  only conflicts with  $T_2$ , both transactions must commit in  $E_1$ , and  $T_1, T_2$  is the only serialization (here  $R(X_2)$  and  $R(X_3)$  return the initial values in  $T_1$ ). Also, the serialization is matched by a sequential execution of *LL* in which *Contains(3)* is followed by *Remove(3)*. Thus,  $I^{MP}$  is indeed an LS-linearizable implementation of  $(LL, set)$  that accepts  $S_1$ .  $\square$

**Corollary 12**  $\mathcal{M} \not\subseteq \mathcal{L}$ .

## 4.3 Single-version 1-progressive TMs

Our reasoning around the schedule in Figure 4 assumed MV-permissive TMs that may have to maintain exponentially many versions of transactional objects [20]. We now describe an alternative progress condition, called *1-progressiveness*, that allows for *single-version* implementations. We further show that *OP*, the class of implementations based on 1-progressive TMs, is not superseded by  $\mathcal{L}$ , i.e., accept schedules that cannot be accepted by any lock-based implementation.

Formally, a TM implementation is *1-progressive* if (1) an updating transaction aborts only if it conflicts with another updating and (2) a read-only transaction aborts only if it conflicts with



**Proof.** Let  $I$  be any lock-based LS-linearizable linked-list implementation and suppose that  $I$  accepts both  $S_2$  and  $S'_2$ . Let  $E$  and  $E'$  be the corresponding executions. We establish a contradiction by showing that  $I$  then also accepts  $S_1$  or  $S'_1$ .

Since, by Lemma 13,  $S_1$  cannot be accepted, and  $p_2$  cannot distinguish  $S'_2$  and  $S_1$ ,  $p_1$  must use a different locking scheme when executing  $Remove(3)$  and  $Insert(3)$ . In particular, in  $Insert(3)$  (schedules  $S_1$  and  $S_2$ ),  $p_1$  must grab a lock on  $X_1$  just before executing  $R(X_1)$ . (Recall that we assume the dynamic locking scheme, so  $p_1$  can only acquire a lock on  $X_1$  at this point.)

But since  $S_2$  is accepted,  $p_2$  does not grab a conflicting lock on  $X_1$  before it distinguishes  $S_2$  from  $S_1$  (i.e., it has completed  $R(X_2)$  and is about to execute  $W(X_2)$ ). Thus, in  $S_1$ ,  $p_1$  must grab a conflicting lock on  $X_1$  *just before* executing  $W(X_1)$ . Now we consider two cases:

- In  $S_1$ ,  $p_2$  acquires a shared lock on  $X_1$  before executing  $W(X_1)$ . Thus,  $p_1$  acquires an exclusive lock on  $X_1$  before  $R(X_1)$  in executing  $Insert(3)$  (in particular, in  $S_2$ ).

Since  $S_2$  is accepted,  $p_2$  holds no lock on  $X_1$  in executing  $Insert(2)$  in  $E$ . But  $p_2$  cannot distinguish  $S_2$  and  $S'_1$ . Thus, in  $S'_1$ ,  $p_2$  observes no conflicts while executing  $Insert(2)$  and completes the operation. On the other hand, when  $p_1$  executes  $R(X_2)$  and  $W(X_1)$ ,  $p_2$  has already terminated its operation and released all the locks. Thus,  $S'_1$  is also accepted by  $I$ —a contradiction with Lemma 13.

- In  $S_1$  (and, thus, in  $S'_2$ ),  $p_2$  acquires an exclusive lock on  $X_1$  before executing  $W(X_1)$ .

Since  $S'_2$  is accepted,  $p_1$  acquires no locks before  $R(X_1)$  in  $S'_2$ . But  $p_1$  cannot distinguish  $S'_2$  and  $S'_1$  before it executes  $R(X_2)$ . Thus, in  $S'_1$ ,  $p_2$  observes no conflicts while executing  $Insert(2)$  and completes the operation. On the other hand, when  $p_1$  executes  $R(X_2)$  and  $W(X_1)$ ,  $p_2$  has already terminated its operation and released all the locks. Thus,  $S'_1$  is also accepted by  $I$ —a contradiction with Lemma 13.

Thus,  $I$  does not accept one of the schedules in  $\{S_2, S'_2\}$ . □

On the other hand, any implementation based on a 1-progressive TM (e.g., our single-version TM in Appendix C) ensures:

**Lemma 15**  $\forall I \in \mathcal{T}_{OP}(LL, set), \{S_2, S'_2\} \subseteq \mathcal{S}(I)$ .

**Proof.** Let  $E$  denote an execution of  $I$  in which transactions  $T_1$  and  $T_2$  encapsulate  $Insert(3)$  and  $Insert(2)$ , respectively, interleaved as in schedule  $S_2$ .  $T_2$  is an updating transaction that does not observe a conflict with another updating transaction in  $E$ . Also,  $T_1$  is a read-only transaction that is allowed to abort only when it conflicts with another transaction over at least two t-objects. Thus, by 1-progressiveness, both  $T_1$  and  $T_2$  must commit in  $E$ .

The proof for  $S'_2$  is analogous to the proof for  $S_2$ . □

Lemmas 14 and 15 together with our implementation in Appendix C imply:

**Theorem 16** *There exists  $I^{OP} \in \mathcal{T}_{OP}(LL, set)$  based on 1-progressive single-version TM that cannot be superseded by locks, i.e., for any  $I \in \mathcal{T}_{\mathcal{L}}(LL, set)$ ,  $\mathcal{S}(I^{OP}) \not\subseteq \mathcal{S}(I)$ .*

## 5 Related work

Our correctness criterion (LS-linearizability) not only requires the high-level history to be linearizable, but also put restrictions on the base object accesses, as in strengthened versions of linearizability [2, 7], but differs in that it expects the execution to look sequential with respect to a given sequential implementation (local serializability). In fact, local serializability can complement any of the restricted linearizability criteria in [2, 7].

The idea of measuring the concurrency properties of LS-linearizable implementations via the set of accepted schedules generalizes the notion of the *input acceptance* metric proposed to compare specific classes of TMs [10]. Our concurrency metric, however, is not restricted to the TM context and can be applied to any synchronization technique.

Empirical studies [6, 21, 22] suggested that transactions can be as efficient as fine-grained locking. Our results exhibit a much more involved picture of relative concurrency properties of TMs and locks, where TM’s progress conditions is an important factor. Conflict-resolving TMs are shown to be superseded by locks. On the other hand, MV-permissive and 1-progressive TMs accept schedules that cannot be accepted by any lock-based implementation.

Locks and TMs were compared in the context of polymorphic and monomorphic transactions [8], with respect to a single schedule of a specific implementation, making it difficult to draw general conclusions. In [9], the programming interface of locks was argued to provide more expressiveness than transactions in terms of programming ability.

## 6 Concluding remarks

In this paper, we focused on implementations that allow for running sequential code in concurrent environments. We defined what it means for such implementations to be correct via a combination of linearizability and local serializability. Then we analyzed relative amount of concurrency properties of LS-linearizable implementations using fine-grained locking and TMs (cf. Figure 1).

This work has two important implications. First, it gives a language to reason about the “best” synchronization techniques for a given data structure. Second, if we are restricted to use just one synchronization technique (e.g., transactional memory with specific consistency and progress guarantees), we can reason about suitability of a specific data structure. The analysis of the resulting concurrent implementation may give hints on how to adjust the data structure for better performance, e.g., by modifying its sequential implementation or object type.

Many questions are yet to be resolved. The concurrency of the important class of *relaxed* transactional models should be better understood [1, 5, 13, 18]. Relaxed TMs provide weaker consistency guarantees, compared to strict serializability and opacity, such as *elastic opacity* [5]. We conjecture that, for many important applications, such as search data structures, relaxed TM implementations may allow for strictly greater concurrency than locks. Our preliminary investigations indicate that the results in Section 4.3 can be extended to show that the linked-list implementation based on  $\mathcal{E}$ -STM [5] (providing elastic opacity) accepts schedules that cannot be accepted by any lock-based implementations. Moreover, we conjecture that, at least with respect to  $(LL, set)$ ,  $\mathcal{E}$ -STM allows for accepting *all* schedules accepted by *HOH* and, thus, possibly by any lock-based implementation.

In the TM context, we only considered schedules triggered by committed transactions, which was enough for deriving concurrency lower bounds. One may argue that this is not sufficient if we want to prevent the user from ever observing an inconsistent state, even if its operation is not taking

effect, suggesting that strict serializability may not be an adequate TM consistency property. How the amount of concurrency is affected by extending local serializability to aborted transactions is unclear.

One more important open question is how much the amount of concurrency tells us about the actual performance of an LS-linearizable implementation on a real multiprocessor machine with relaxed memory models, given the indications that high degrees of concurrency in software TMs may have a degrading effect on the resulting performance [16].

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## A Sequential Implementation of Integer Set

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**Algorithm 1** Sequential implementation *LL* (*sorted linked list*) of *integer set* type

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<pre> 1: <b>Shared variables:</b> 2:   Nodes <i>Head</i>, <i>Tail</i>, <math>X_1, \dots</math> 3: <b>Local variables:</b> 4:   Boolean <i>res</i>, <math>\leftarrow</math> false  5: <b>Locate(s):</b> 6:   <i>prev</i> <math>\leftarrow</math> <i>Head</i> 7:   <i>curr</i> <math>\leftarrow</math> <i>prev.next</i> 8:   <b>while</b> (<i>curr.val</i> &lt; <i>s</i> <math>\vee</math> <i>curr</i> = <i>Tail</i>) <b>do</b> 9:     <i>prev</i> <math>\leftarrow</math> <i>curr</i> 10:    <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 11:  <b>end while</b> 12:  <b>return</b> <math>\langle</math><i>prev</i>, <i>curr</i><math>\rangle</math>  13: <b>Contains(s):</b> 14:  <math>\langle</math><i>prev</i>, <i>curr</i><math>\rangle</math> <math>\leftarrow</math> <i>Locate</i>(<i>s</i>) 15:  <b>if</b> <i>curr.val</i> = <i>s</i> <b>then</b> 16:    <i>res</i> <math>\leftarrow</math> true 17:  <b>else</b> 18:    <i>res</i> <math>\leftarrow</math> false 19:  <b>return</b> <i>res</i> </pre>	<pre> 20: <b>Insert(s):</b> 21:  <math>\langle</math><i>prev</i>, <i>curr</i><math>\rangle</math> <math>\leftarrow</math> <i>Locate</i>(<i>s</i>) 22:  <b>if</b> <i>curr.val</i> <math>\neq</math> <i>s</i> <b>then</b> 23:    <math>X_s</math> <math>\leftarrow</math> <i>new-node</i>(<i>s</i>) 24:    <math>X_s.next</math> <math>\leftarrow</math> <i>curr</i> 25:    <i>prev.next</i> <math>\leftarrow</math> <math>X_s</math> 26:    <i>res</i> <math>\leftarrow</math> true 27:  <b>else</b> 28:    <i>res</i> <math>\leftarrow</math> false 29:  <b>return</b> <i>res</i>  30: <b>Remove(s):</b> 31:  <math>\langle</math><i>prev</i>, <i>curr</i><math>\rangle</math> <math>\leftarrow</math> <i>Locate</i>(<i>s</i>) 32:  <b>if</b> <i>curr.val</i> = <i>s</i> <b>then</b> 33:    <i>prev.next</i> <math>\leftarrow</math> <i>curr.next</i> 34:    <i>free</i>(<i>curr</i>) // Deallocate node 35:    <i>res</i> <math>\leftarrow</math> true 36:  <b>else</b> 37:    <i>res</i> <math>\leftarrow</math> false 38:  <b>return</b> <i>res</i> </pre>
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In this section, we recall the sequential specification of the *integer set* type (denoted *set*) and describe a sequential implementation using a *sorted linked-list* data structure.

The type *set* is specified by the following operations: *Insert*, *Remove* and *Contains*. The sequential specification of *set* is as follows: Given an set  $S \subseteq \mathbb{Z}$  and an element  $s \in \mathbb{Z}$ :

- *Insert*(*s*) augments the set *S* with the element *s* if  $s \notin S$  and returns *true*, otherwise *S* is unchanged and returns *false*
- *Remove*(*s*) removes the element *s* from *S* if *s* is not in *S* and returns *true*, otherwise *S* is unchanged and returns *false*
- *Contains*(*s*) returns *true* if the element *s* is present in *S*, returns *false* otherwise

The corresponding sequential implementation *LL* is presented in Algorithm 1. The implementation uses a *sorted linked list* data structure in which each node (except the *Tail*) maintains a *next* field to provide a pointer to the next node.

## B Hand-over-hand locking (*HOH*)

In this section, we describe the implementation  $I^{HOH}$  (Algorithm 2) of an *integer set* type based on *hand-over-hand* locking [4]. In brief, *HOH* works as follows. Each object in the list is associated with a lock. Each node apart from the *Tail* contains a pointer *next* to a valid next node in the list when it is unlocked. An element is inserted into the list in the appropriate position while holding



the locks of the two adjacent nodes. The *Remove* node method redirects the predecessor's *next* field to make the node unreachable to other processes and then deallocates the node.

**Theorem 17 (Theorem 6)**  $I^{HOH}$  is *LS-linearizable* with respect to  $(LL, set)$ .

**Proof.** Let  $E$  denote an execution of  $I^{HOH}$  and  $H$ , the corresponding history. Let  $<_E$  denote a total-order on events in  $E$  and  $\tilde{H}$  denote the high-level history of  $H$ . The linearization point of an operation  $\pi$ , denoted as  $\ell_\pi$  is associated with an event performed during the lifetime of  $\pi$  using the following procedure. First, we obtain a completion of  $\tilde{H}$  by completing every pending operation or discarding events from an operation as follows:

- Every event from an incomplete *Contains* operation is discarded.
- Every event from an incomplete *Insert* operation that has not performed the action in Line 28 of the *Insert* operation is discarded.
- Every event from an incomplete *Remove* operation that has not performed the action in Line 58 of the *Remove* operation is discarded from  $E$ ; otherwise, it is completed with the step in Line 59.

Next, we obtain a sequential high-level history  $S$  by associating linearization points with operations. For every operation  $\pi$ ,  $\ell_\pi$  is defined as follows:

- If  $\pi$  is *Contains*,  $\ell_\pi$  is associated with the successful acquisition of the lock for the last *read* on a node (excluding *Tail*) in Line 72.
- If  $\pi$  is *Insert*,  $\ell_\pi$  is associated with Line 23 of the *Insert* operation.
- If  $\pi$  is *Remove*,  $\ell_\pi$  is associated with Line 55 of the *Remove* operation.

### High-level linearization.

**Lemma 18** If  $\pi_i \rightarrow_{\tilde{H}} \pi_j$ , then  $\pi_i \rightarrow_S \pi_j$ .

**Proof.** It is easy to see that the real-time ordering of operations is respected in  $S$  since linearization points are chosen within the lifetime of the operation.  $\square$

**Lemma 19**  $S$  is consistent with the type integer set.

**Proof.** If *Contains*( $s$ ) returns *true* in  $\tilde{H}$ , there exists *Insert*( $s$ ) that returns *true* in  $\tilde{H}$  such that  $\text{Insert}(s) \rightarrow_{\tilde{H}} \text{Contains}(s)$ . Then,  $\text{Insert}(s) \rightarrow_S \text{Contains}(s)$  since  $\ell_{\text{Insert}(s)}$  is associated with the acquisition of the exclusive lock on node (say)  $X_s$  and no other process can read  $X_s$  until the process executing *Insert*( $s$ ) releases  $X_s$ .

Also, there exists no  $\pi = \text{Remove}(s)$  that returns *true* in  $\tilde{H}$  such that  $\text{Insert}(s) \rightarrow_S \pi \rightarrow_S \text{Contains}(s)$ . Let processes  $p_1$  and  $p_2$  execute operations  $\pi$  and *Insert*( $s$ ) respectively. Suppose that such a  $\pi$  exists. Then,  $\ell_{\text{Insert}(s)} <_E \ell_\pi <_E \ell_{\text{Contains}(s)}$ ,  $p_1$  acquires the exclusive lock on node (say  $X_s$ ) that contains the value  $s$  following which  $p_2$  attempts to read  $X_s$ . Process  $p_2$  can only read  $X_s$  after  $p_1$  has released the lock on  $X_s$ . But prior to release of the lock on  $X_s$ ,  $p_1$  *physically* deletes

$X_s$  from the list by redirecting the predecessor's *next* field to the node immediately succeeding  $X_s$ . Thus, the check in Line 78 fails and *Contains*( $s$ ) must return *false*—contradiction.

Now, if *Contains*( $s$ ) returns *false* in  $\tilde{H}$ , there does not exist *Insert*( $s$ ) that returns *true* such that *Insert*( $s$ )  $\rightarrow_S$  *Contains*( $s$ ) or there exists an *Insert*( $s$ ) that returns *true* and *Remove*( $s$ ) that returns *true* such that *Insert*( $s$ )  $\rightarrow_S$  *Remove*( $s$ )  $\rightarrow_S$  *Contains*( $s$ ). Again, the same arguments as above verify this claim.  $\square$

From Lemmas 19 and 18, the proof follows.

For the second part, we need to show that for all high-level operations  $\pi$  in  $H$ , there exists a sequential history  $S$  of  $LL$  such that  $H|\pi = S|\pi$ .

Consider any execution of *Contains*( $s$ ) by a process  $p_i$  in  $I^{HOH}$ . Process  $p_i$  cannot access a node deallocated from the list since the node and its predecessor are held exclusively by the process executing the *Remove* operation. Let  $X_s$  be the node that contains the value  $s$ . Suppose that  $p_i$  acquires the lock on  $X_s$  in shared mode, then process  $p_j$  executing *Remove*( $s$ ) cannot acquire the lock on  $X_s$ . Thus, *Contains*( $s$ ) precedes *Remove*( $s$ ) in the linearization. Otherwise if  $p_j$  acquires the lock in exclusive mode on  $X_s$  prior to  $p_i$ , then  $p_i$  cannot read  $X_s$  until  $p_j$  releases the lock on  $X_s$  and thus is linearized after *Remove*( $s$ ). In either case, the execution is consistent with the sequential execution of *Contains*( $s$ ).

Let  $p_i$  be any process executing *Insert*( $s$ ) in  $I^{HOH}$ . Then,  $p_i$  acquires the exclusive lock on node  $X_{s-1}$  (assuming the new node to be inserted is  $X_s$ ). Thus, any other process that attempts to read  $X_{s-1}$  must observe the new element inserted and is linearized after the *Insert*( $s$ ).

Let  $p_i$  be any process executing *Remove*( $s$ ) in  $I^{HOH}$ . Then,  $p_i$  acquires the exclusive lock on node  $X_s$  and  $X_{s-1}$ . Consider any concurrent process  $p_j$  that executes *Contains*( $s$ ),  $p_j$  reads  $X_{s-2}$  and then attempts to acquire the lock on  $X_{s-1}$ , but  $X_{s-1}$  is locked by  $p_i$ . Thus,  $p_j$  waits until  $p_i$  releases the lock on  $X_{s-1}$  and then proceeds to acquire the lock on it in shared mode. Thus, *Remove*( $s$ ) is linearized prior to *Contains*( $s$ ). Process  $p_j$  traverses the entire list until it reaches the *Tail* and returns *false*.  $\square$

## C 1-progressive single-version TM implementation

Algorithm 3 describes a *1-progressive* TM implementation  $I^{OP}$ . The implementation uses a *wait-free multi-trylock* object described in [16].

Let  $E$  be any execution of the TM implemented by Algorithm 3. We assume every t-object is initialized by some fictitious committed transaction  $T_0$  that precedes  $E$ . Let  $<_E$  denote a total-order on events in  $E$ .

For a transaction  $T_k$  that appears in  $E$ , the *write set* (resp., the *read set*) of a transaction  $T_k$ , denoted  $Wset(T_k)$  (resp.,  $Rset(T_k)$ ), is the set of t-objects that are written (resp., read) in  $T_k$ .

**Linearization points.** Let  $H$  denote a linearization of  $E|_{TM}$  constructed by selecting *linearization points* of tm-operations performed in  $E|_{TM}$ . The linearization point of a tm-operation  $op$ , denoted as  $\ell_{op}$  is associated with a base object event or a tm-event performed during the lifetime of  $op$  using the following procedure.

First, we obtain a completion of  $E|_{TM}$  by removing some pending invocations and adding responses to the remaining pending invocations involving a transaction  $T_k$  as follows:

- Every incomplete  $read_k$ ,  $write_k$  or  $tryA_k$  operation is removed from  $E|_{TM}$
- For every pending  $tryC_k$ , if some base object  $v_j$  was written (Line 32),  $tryC_k$  is completed with the steps in 32 and 33 and the response  $C_K$  is added to the end of  $E|_{TM}$ . Otherwise,  $A_k$  is added to the end of  $E|_{TM}$ .

Now a linearization  $H$  of  $E|_{TM}$  is obtained by associating linearization points to tm-operations in the obtained completion of  $E|_{TM}$  as follows:

- For every tm-read  $op_k$ ,  $\ell_{op_k}$  is chosen as the event in Line 9 of Algorithm 3
- For every tm-write or tm-abort  $op_k$ ,  $\ell_{op_k}$  is chosen as the invocation event of  $op_k$
- For every  $op_k = tryC_k$  such that  $Wset(T_k) \neq \emptyset$ ,  $\ell_{op_k}$  is associated with the successful release of the lock on  $Wset(T_k)$  (Line 33)
- For every  $op_k = tryC_k$  such that  $Wset(T_k) = \emptyset$ ,  $\ell_{op_k}$  is associated with the first step performed in Line 22.

$<_H$  denotes a total-order on tm-operations in the history  $H$ .

**Serialization points.** The serialization of a transaction  $T_j$ , denoted as  $\delta_{T_j}$  is associated with the linearization point of a tm-operation performed within the lifetime of the transaction.

We obtain a t-complete history  $\bar{H}$  from  $H$  as follows:

- For every transaction  $T_k$  in  $H$  that has not invoked  $tryC_k$ , we insert  $tryC_k \cdot A_k$  immediately after the last event of  $T_k$  in  $H$
- For every aborted transaction  $T_k$  in  $H$ , we remove all events associated with the transaction

A serialization  $S$  is obtained by associating serialization points to transactions in  $\bar{H}$  as follows:

- For every updating transaction  $T_k$ ,  $\delta_{T_k}$  is  $\ell_{tryC_k}$ .
- If  $T_k$  is a read-only transaction, then  $\ell_{op_k}$  is associated with the linearization point of the first tm-read performed in  $T_k$

$<_S$  denotes a total-order on transactions in the t-sequential history  $S$ .

**Lemma 20** *If  $T_i \prec_{\bar{H}} T_j$ , then  $T_i <_S T_j$*

**Proof.** This follows from the fact that for a given transaction, its serialization point is chosen within the lifetime of the transaction implying if  $T_i \prec_{\bar{H}} T_j$ , then  $\delta_{T_i} <_E \delta_{T_j} \implies T_i <_S T_j$   $\square$

**Lemma 21**  *$S$  is legal*

**Proof.** Recall that  $S$  is legal if every tm-read of an object  $X$  performed by a transaction  $T_i$  returns the response of the latest value written to  $X$  in  $S$ . The latest value written to  $X$  in  $S$  is the value written by the last transaction  $T_j$  such that  $T_j <_S T_i$  and  $X \in Wset(T_j)$ .

To prove that  $S$  is legal, we need to show that if there exists a  $read_j(X)$ ,  $X \in Rset(T_j) \cap Wset(T_i)$  that returns the value of  $X$  updated in  $write_i(X, value)$  (this is well-defined since every value written

to shared-memory by a transaction is associated with the unique identifier of the transaction), then there does not exist a transaction  $T_k$ ,  $X \in Wset(T_k)$  such that  $T_i <_S T_k <_S T_j$ . Suppose there exists no such  $T_k$ . We need to show that  $T_i <_S T_j$ .

Consider two cases:

- (1) Suppose that  $T_j$  is a read-only transaction. Let  $read_j(X')$  be the first tm-read performed by  $T_j$ . By assumption,  $\delta_{T_j}$  and  $\delta_{T_i}$  are  $\ell_{read_j(X')}$  and  $\ell_{tryC_i}$  respectively. Since there exists no concurrent transaction that writes to some  $X_j \in Rset(T_j)$ , it is easy to see that  $T_i, T_j$  is a legal serialization.
- (2) Suppose that  $T_j$  is an updating transaction. Thus,  $\delta_{T_j}$  and  $\delta_{T_i}$  are  $\ell_{tryC_j}$  and  $\ell_{tryC_i}$  respectively. Thus,  $T_i, T_j$  is a legal serialization.

Suppose such a  $T_k$  exists. Consider two cases:

- (2) Suppose that  $T_j$  is a read-only transaction. Assume the contrary that
  - there exists a  $read_j(X)$ ,  $X \in Rset(T_j) \cap Wset(T_i)$  that returns the value of  $X$  updated in  $write_i(X, value)$
  - $\exists T_k, X \in Wset(T_k)$  such that  $T_i <_S T_k <_S T_j$

Since  $\ell_{tryC_i} <_E \ell_{tryC_k}$ ,  $T_i$  releases the lock on  $X$  prior to the release of the lock on  $X$  by  $T_k$ . Also,  $T_k$  can acquire the lock on  $X$  only after the release of the lock on  $X$  by  $T_i$ . By assumption, the release of the lock on  $X$  (and consequently the write of  $X$  to shared-memory) precedes the linearization of the tm-read of the first t-object  $X' \in Rset(T_j)$  (Line 9). But then  $read_j(X)$  cannot return the value of  $X$  written by  $T_i$ —contradiction.

- (2) Suppose that  $T_j$  is an updating transaction. If there does not exist any  $Y \in Rset(T_j) \cap Wset(T_k)$ ,  $Y \neq X$  such that  $read_j(Y)$  returns the value of  $Y$  written by  $T_k$ , then  $T_i, T_j, T_k$  is a legal serialization.

Suppose such a  $Y \in Rset(T_j) \cap Wset(T_k)$  exists. Assume the contrary that  $T_i <_S T_k <_S T_j$ . Consider the resulting ordering of events:  $T_i$  acquires the lock on  $X$ , writes to  $X$ , releases the lock on  $X$ ,  $T_k$  acquires the lock on  $X$  and  $Y$ , writes to  $X, Y$  and releases the lock on them. Since  $read_j(X)$  returns the value of  $X$  written by  $T_i$ ,  $\ell_{read_j(X)}$  precedes the release of the lock by  $T_k$ . Subsequently,  $T_j$  performs  $read_j(Y)$  and performs the check on Line 36 and proceeds to perform the check on Line 37. Since the timestamp of  $X$  has been updated by  $T_k$  since  $T_j$  last read it and  $T_k$  reads the value of  $Y$  written by  $T_k$ , Line 37 returns *true* and  $T_j$  returns  $A_j$ —contradiction.

□

From Lemmas 20 and 21, we have

**Theorem 22**  $I^{OP}$  is strictly serializable.

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**Algorithm 2** Hand-over-hand locking implementation (*sorted linked list*)  $I^{HOH}$  of integer set type

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<pre> 1: <b>Shared variables:</b> 2:   Nodes <i>Head</i>, <i>Tail</i>, <math>X_1, \dots</math>  3: <b>Local variables:</b> 4:   Boolean <i>result</i>, <math>\ell</math>, <math>\leftarrow</math> false  5: <b>Insert(s):</b> 6:   <i>prev</i> <math>\leftarrow</math> <i>Head</i> 7:   spinLock(<i>prev</i>, <i>S</i>) 8:   <i>curr</i> <math>\leftarrow</math> <i>prev.next</i> 9:   spinLock(<i>curr</i>, <i>S</i>) 10:  if <i>curr.val</i> &gt; <i>s</i> then 11:    spinLock(<i>prev</i>, <i>E</i>) 12:    goto Line 25 13:  else 14:    while (<i>curr.val</i> &lt; (<i>s</i> - 1) <math>\vee</math> 15:      <i>curr</i> = <i>Tail</i>) do 16:      release(<i>prev</i>) 17:      <i>prev</i> <math>\leftarrow</math> <i>curr</i> 18:      <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 19:      spinLock(<i>curr</i>, <i>S</i>) 20:    end while 21:    release(<i>prev</i>) 22:    <i>prev</i> <math>\leftarrow</math> <i>curr</i> 23:    spinLock(<i>prev</i>, <i>E</i>) 24:    <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 25:    if <i>curr.val</i> <math>\neq</math> <i>s</i> then 26:      <math>X_s \leftarrow</math> new-node(<i>s</i>) 27:      <math>X_s.next \leftarrow</math> <i>curr</i> 28:      <i>prev.next</i> <math>\leftarrow</math> <math>X_s</math> 29:      <i>result</i> <math>\leftarrow</math> true 30:    else 31:      <i>result</i> <math>\leftarrow</math> false 32:    release(<i>prev</i>) 33:    release(<i>curr</i>) 34:    return <i>ok</i> </pre>	<pre> 35: <b>Remove(s):</b> 36:   <i>prev</i> <math>\leftarrow</math> <i>Head</i> 37:   spinLock(<i>prev</i>, <i>S</i>) 38:   <i>curr</i> <math>\leftarrow</math> <i>prev.next</i> 39:   spinLock(<i>curr</i>, <i>S</i>) 40:   if <i>curr.val</i> <math>\geq</math> <i>s</i> then 41:     spinLock(<i>prev</i>, <i>E</i>) 42:     spinLock(<i>curr</i>, <i>E</i>) 43:     goto Line 57 44:   else 45:     while (<i>curr.val</i> &lt; (<i>s</i> - 1) <math>\vee</math> 46:       <i>curr</i> = <i>Tail</i>) do 47:       release(<i>prev</i>) 48:       <i>prev</i> <math>\leftarrow</math> <i>curr</i> 49:       <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 50:       spinLock(<i>curr</i>, <i>S</i>) 51:     end while 52:     release(<i>prev</i>) 53:     <i>prev</i> <math>\leftarrow</math> <i>curr</i> 54:     <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 55:     spinLock(<i>curr</i>, <i>E</i>) 56:     spinLock(<i>prev</i>, <i>E</i>) 57:     if <i>curr.val</i> = <i>s</i> then 58:       <i>prev.next</i> <math>\leftarrow</math> <i>curr.next</i> 59:       free(<i>curr</i>) 60:       <i>result</i> <math>\leftarrow</math> true 61:     else 62:       <i>result</i> <math>\leftarrow</math> false 63:     release(<i>prev</i>) 64:     release(<i>curr</i>) 65:     return <i>ok</i> </pre>	<pre> 66: <b>Contains(s):</b> 67:   <i>prev</i> <math>\leftarrow</math> <i>Head</i> 68:   spinLock(<i>prev</i>, <i>S</i>) 69:   <i>curr</i> <math>\leftarrow</math> <i>prev.next</i> 70:   spinLock(<i>curr</i>, <i>S</i>) 71:   while (<i>curr.val</i> &lt; <i>s</i> <math>\vee</math> 72:     <i>curr</i> = <i>Tail</i>) do 73:     release(<i>prev</i>) 74:     <i>prev</i> <math>\leftarrow</math> <i>curr</i> 75:     <i>curr</i> <math>\leftarrow</math> <i>curr.next</i> 76:     spinLock(<i>curr</i>, <i>S</i>) 77:   end while 78:   if <i>curr.val</i> = <i>s</i> then 79:     <i>result</i> <math>\leftarrow</math> true 80:   else 81:     <i>result</i> <math>\leftarrow</math> false 82:   release(<i>prev</i>) 83:   release(<i>curr</i>) 84:   return <i>result</i>  85: <b>spinLock(<i>X</i>, <i>mode</i>):</b> 86:   <math>\ell \leftarrow</math> false 87:   while <math>\ell</math> do 88:     <math>\ell \leftarrow</math> acquire<sup><i>mode</i></sup>(<i>X</i>) 89:   end while </pre>
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**Algorithm 3**  $I^{OP}$ ; Implementation of  $T_k$  executed by process  $p_i$ 


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1: Shared variables:
2:    $clock \in \mathbb{N}$ , initially 0 // Global clock
3:    $v_j$ , for each t-object  $X_j$ 
4:    $v_j.ts$ , a timestamp for each object, initially 0
5:    $v_j.tid$ , id of transaction that writes to  $v_j$ , initially  $T_0$ 
6:    $v_j.val$ , value of  $v_j$ 
7:    $L$ , multi-trylock object

8: readk( $X_j$ ):
9:    $ov_j := read(v_j)$ 
10:  if  $X_j \notin Rset(T_k)$  then
11:     $Rset(T_k) := Rset(T_k) \cup \{X_j\}$ 
12:  return  $ov_j.val$ 

13: writek( $X_j, v$ ):
14:    $nv_j.val := v$ 
15:   if  $X_j \notin Wset(T_k)$  then
16:      $Wset(T_k) := Wset(T_k) \cup \{X_j\}$ 
17:   return ok

18: tryAk():
19:   return  $A_k$ 

20: tryCk():
21:   if  $|Wset(T_k)| = \emptyset$  then
22:     if  $isInvalid1()$  then
23:       return  $A_k$ 
24:    $locked := L.acquire(Wset(T_k))$ 
25:   if not  $locked$  then
26:     return  $A_k$ 
27:   if  $isInvalid2()$  then
28:      $L.release(Wset(T_k))$ 
29:     return  $A_k$ 
30:    $time := clock()$  // Every t-object in  $Wset$  is assigned this timestamp
31:   for all  $X_j \in Wset(T_k)$  do
32:      $write(\{v_j.ts, v_j.tid, v_j.val\}, \{time, k, nv_j.val\})$ 
33:    $L.release(Wset(T_k))$ 
34:   return  $C_k$ 

35: Function: isInvalid1():
36:   if  $\exists X_i \in Rset(T_k): ov_i.ts < v_i.ts$  then
37:     if  $\exists X_j \in Rset(T_k): (v_i.ts < ov_j.ts) \wedge (ov_i.ts < ov_j.ts)$  then
38:       return true
39:   return false

40: Function: isInvalid2():
41:   if  $\exists X_j \in Wset(T_k) : L.isContended(X_j)$  then
42:     return true
43:   if  $\exists X_i \in Rset(T_k): (ov_i.ts < v_i.ts)$  then
44:     return true
45:   return false

```

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